



PMM Science Team Meeting 2019

# *Assessment of snowfall observational capabilities of GMI and ATMS through the exploitation of observational datasets*

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in collaboration with:

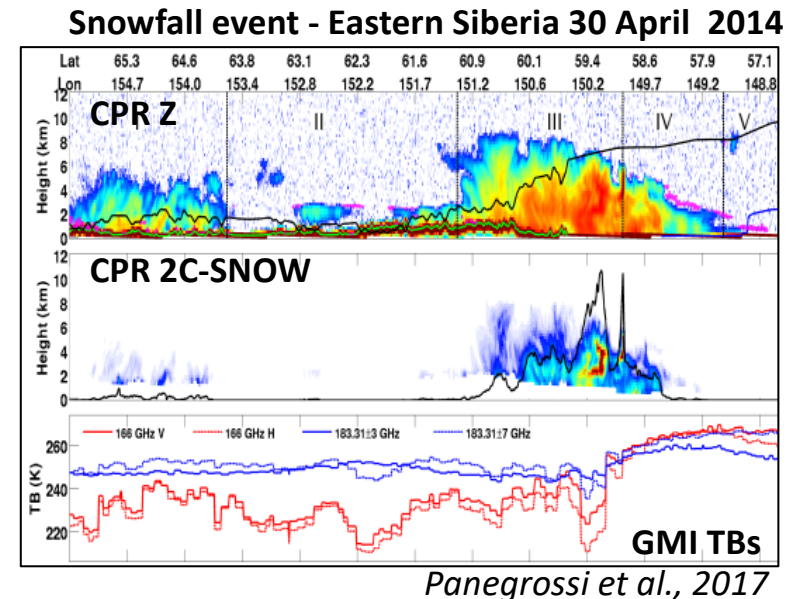
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Pierre Kirstetter (Univ. of Oklahoma, NOAA), Joe Turk (NASA JPL)

# Motivations and Goals

1. Proven/shown sensitivity of the PMW sensors to the presence of snow/ice clouds and (indirectly) to snowfall
  - Satellite-based snowfall detection and quantification remains a big scientific challenge (high latitudes)
2. Studies based on GPM/CloudSat-Calipso coincidence dataset demonstrate:
  - impact of supercooled liquid water and environmental conditions on GMI snowfall spectral signature
  - Great potentials for algorithm development (e.g., SLALOM, Rysman et al., 2018, 2019)

## Objectives

1. Contribute to LSWG intercomparison/validation experiment of GPM-era snowfall products
2. Extend analysis of snowfall detection capabilities to other PMW radiometers (ATMS) using CloudSat
  - Understand interconnection between supercooled water, environmental conditions (frozen background surface and TPW) , and cloud vertical structure, on PMW snowfall spectral signature



# GPM-era MW products validation experiment

Objective quality assessment of currently available snowfall MW-based products using ground-based radar measurements

- Ground-based snowfall datasets:
  - **MRMS datasets:**
    - **Case study analysis (13 cases selected based on CPR/GPM coincidences)**
      - 0.01°x0.01° resolution at 2 min time step with the indication of quality and phase
    - **One year statistical analysis (01 May 2014-31 May 2015)**
      - MRMS dataset matched with GMI (at 15 km resolution) with indication of phase
  - **Operational NEXRAD network polarimetric measurements (for case studies analysis);**
- MW snowfall products considered :
  - GPM DPR products (V05)
  - CloudSat CPR products (V05)
  - **GMI products (NASA GPROF (V05), CNR-ISAC SLALOM)**
  - ATMS and MHS products (NASA GPROF, NOAA, CNR-ISAC 183-WSL)



# SLALOM: Snowfall retrieval algorithm for GMI



It is based on the GMI/CPR coincidence dataset V03B (Joe Turk, JPL)

Input: GMI L1c TBs (all channels) and auxiliary ECMWF analysis variables

*No auxiliary info on background surface conditions;*

**Random forest modules** for snowfall detection and supercooled liquid water detection (*at the cloud top*);

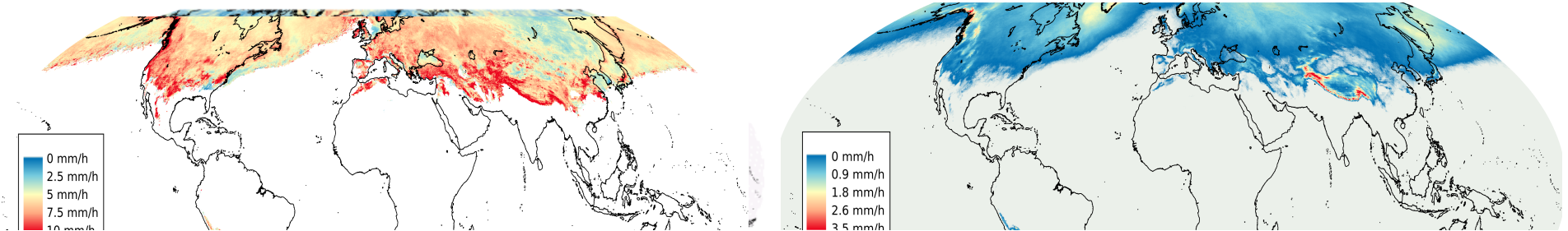
**Multi-linear regression:** snow water path (SWP) estimates (Rysman et al., Rem. Sens., 2018)

**New gradient boosting module for Surface snowfall rate (SSR) (Rysman et al., GRL, 2019)**

Mean SSR (mm/h) between May 2014 and May 2017

Conditioned (SSR > 0 mm/h)

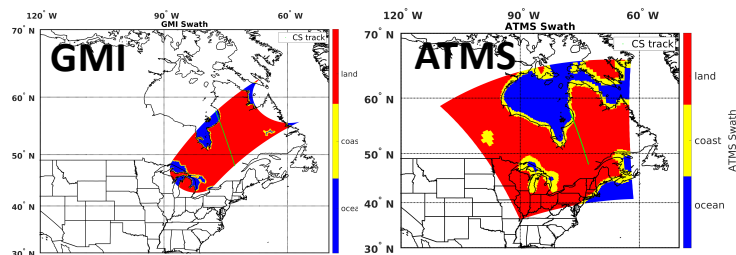
Unconditioned



## SLALOM main limitations:

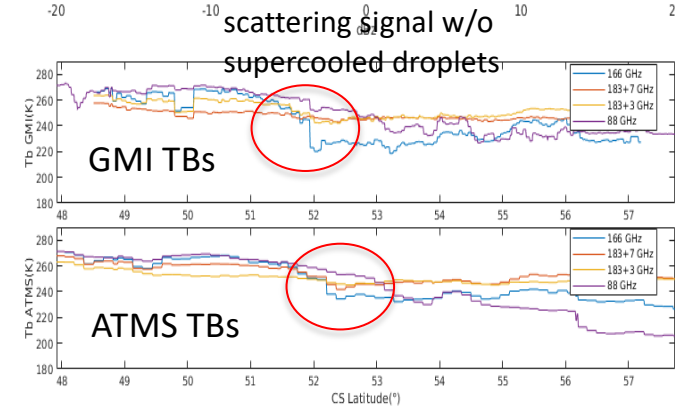
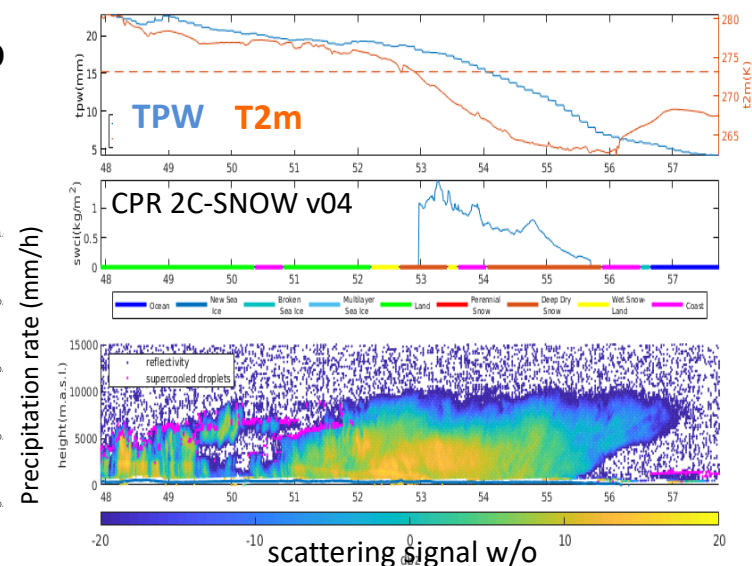
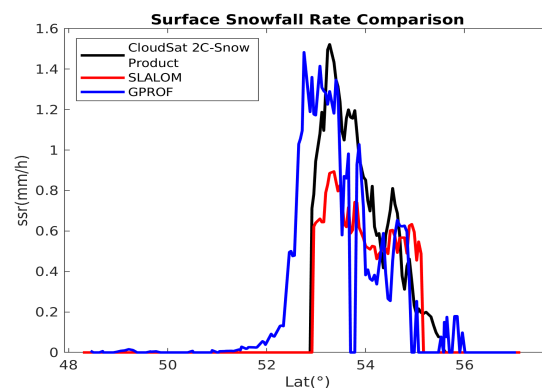
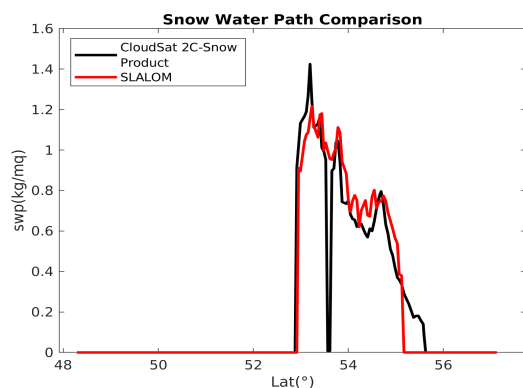
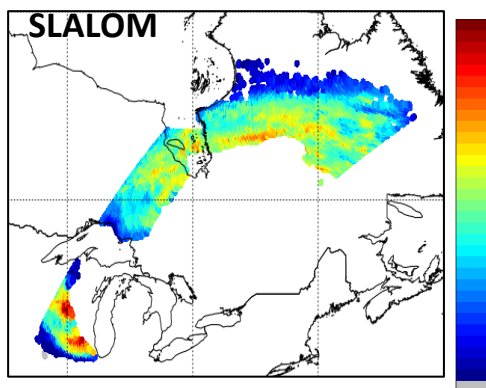
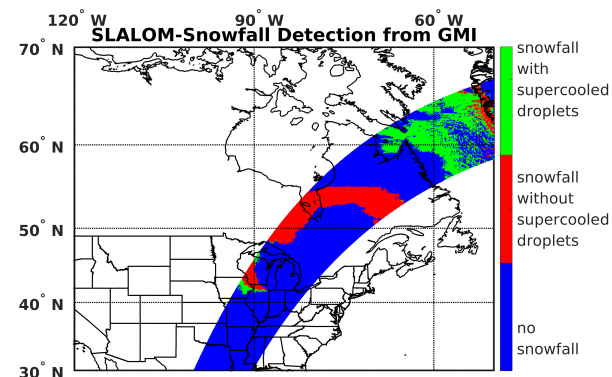
- **SLALOM fully relies on the 2C-SNOW-PROFILE CPR product (V04)**, e.g., misses lower layers, no mixed-phase precip., underestimation higher snowfall intensity;
- GMI/CPR observations mostly occur around 60°N/S and are affected by daylight-only mode of CloudSat;
- Effect of embedded supercooled droplets is not considered (30% of cases)



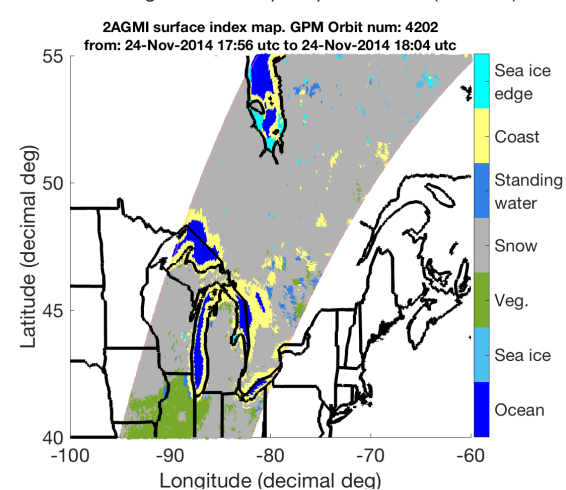
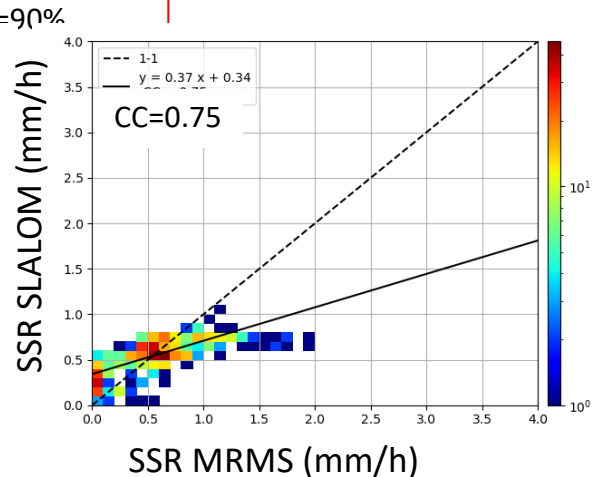
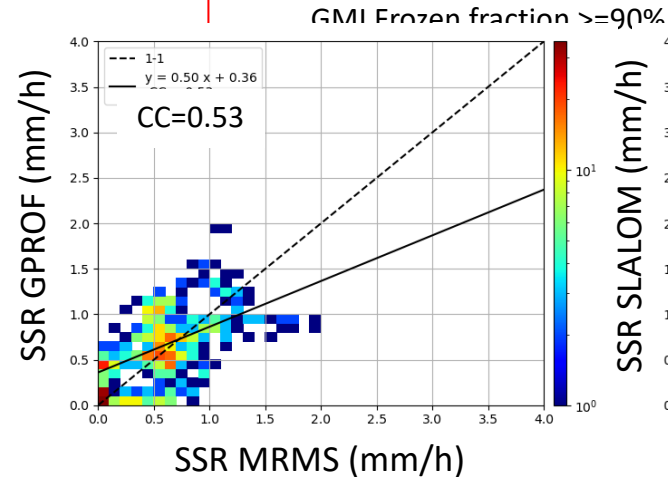
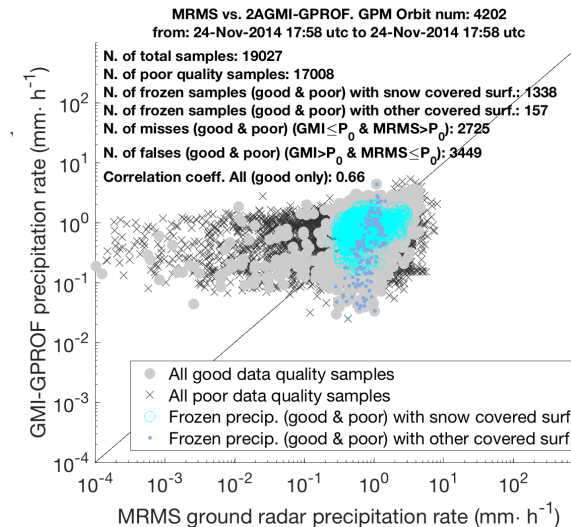
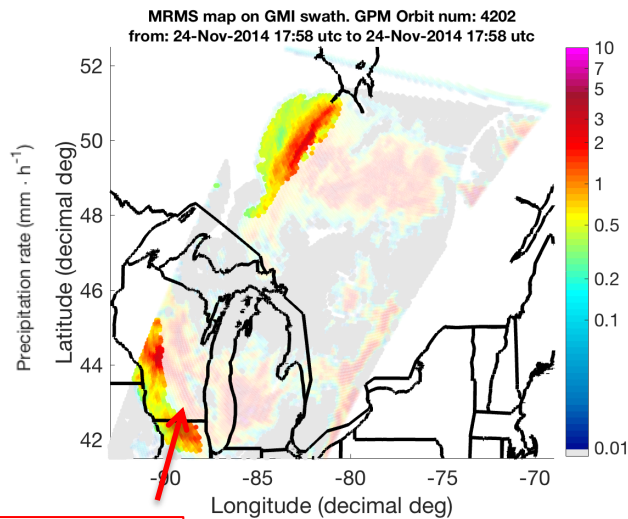
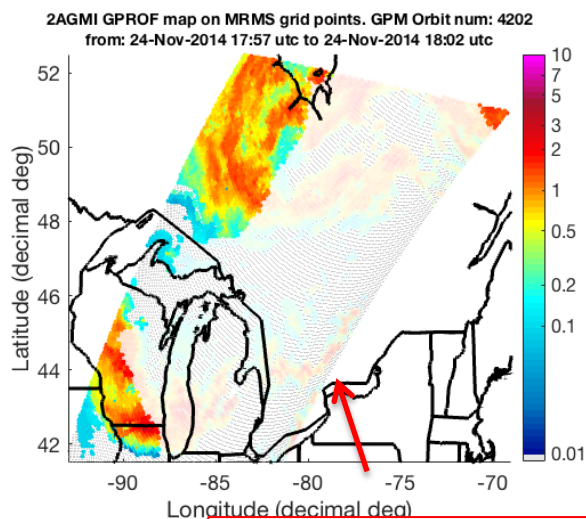


# Snowfall event 24 November 2014 over U.S./Canada

GPM (DPR GMI)  
CloudSat/Calipso  
ATMS



# Case study 24 Nov. 2014 orbit 4202: MRMS vs. GPROF and SLALOM

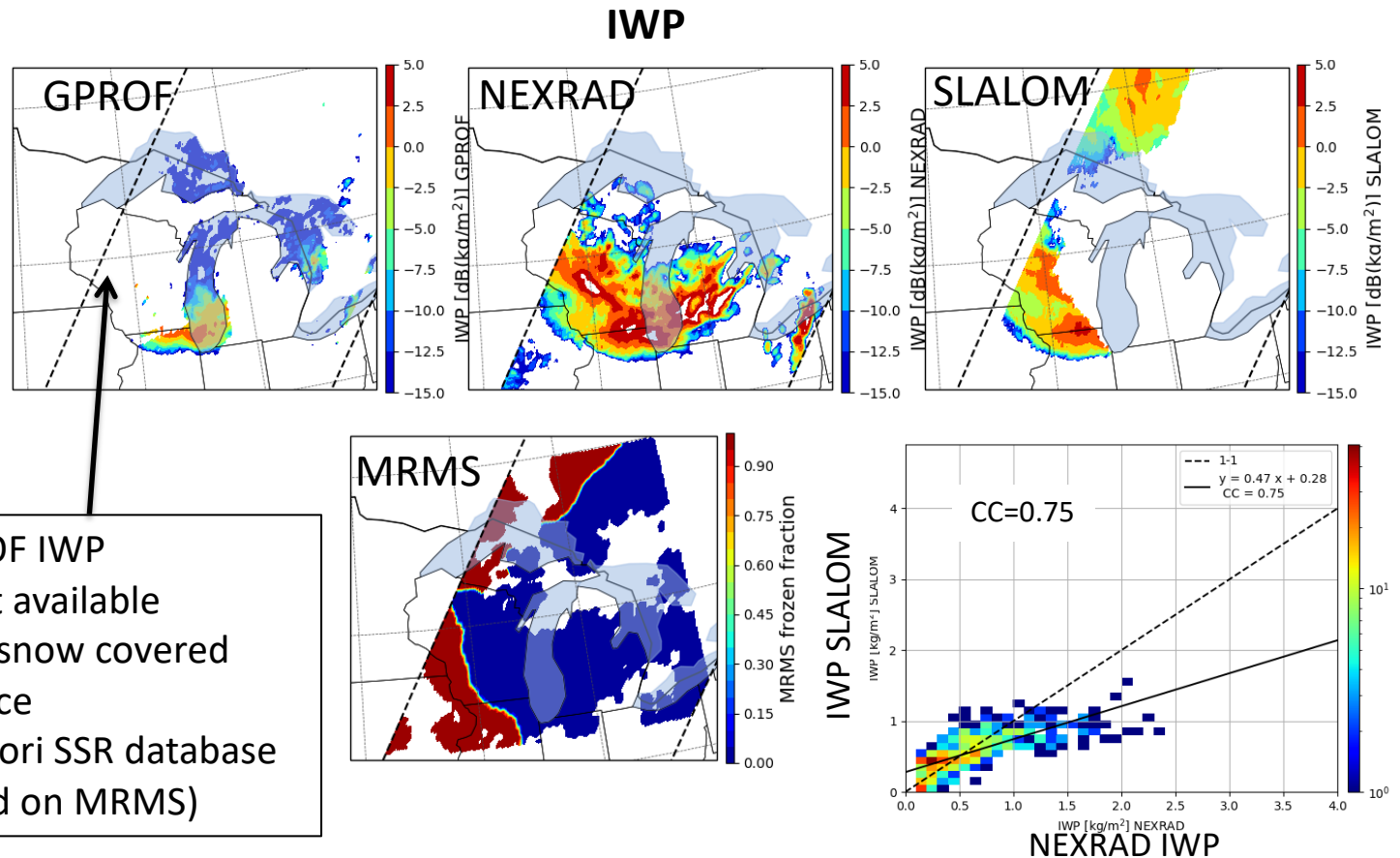
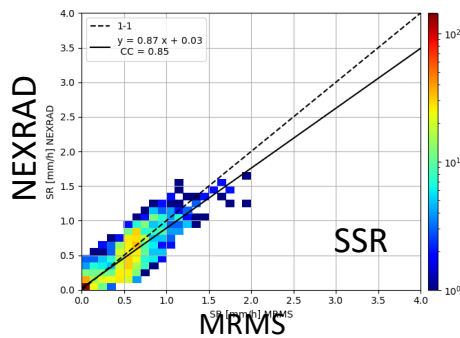


# SR estimates from NEXRAD polarimetric measurements (Z and K<sub>DP</sub>)

Bukovcic et al (2018)

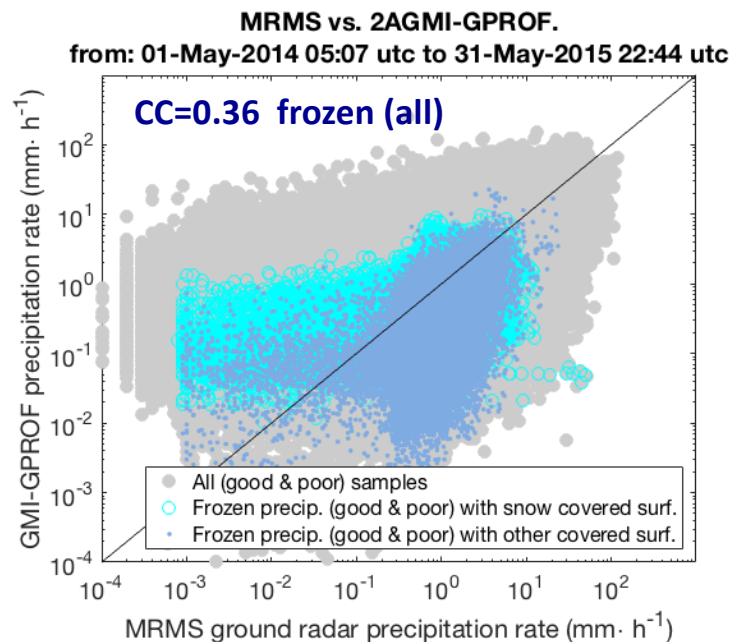
$$S(K_{DP}, Z) = 1.48 K_{DP}^{0.61} Z^{0.33}$$

$$IWC(K_{DP}, Z) = 0.71 K_{DP}^{0.65} Z^{0.28}$$



# GPROF vs. MRMS: case studies and one-year analysis

## May 2014-May 2015 one year analysis

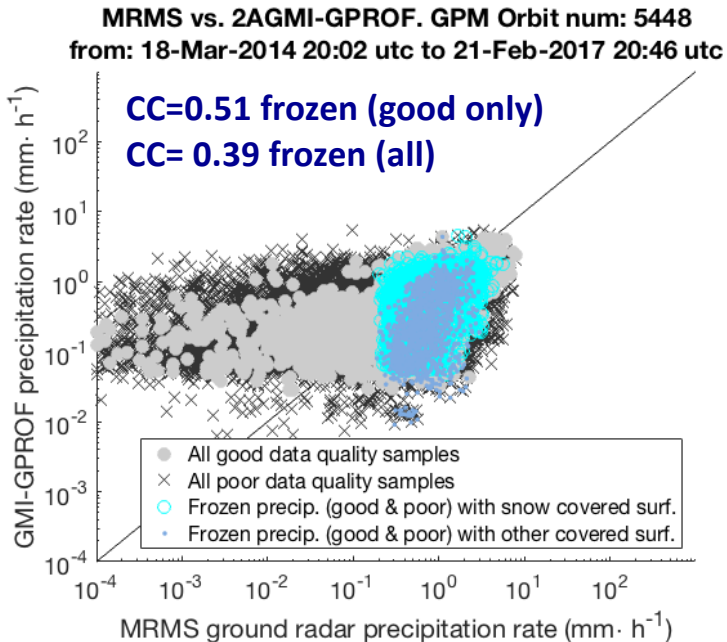


GMI &MRMS  
Frozen fraction  
>=90%

2014/15  
analysis

SR>0.01 mm/h	CC	Bias (GV-PMW)	RMSE
Snow Surf.	0.31	0.33 mm/h	0.80 mm/h
Other surf.	0.47	0.61 mm/h	1.08 mm/h

## 13 Case studies analysis



Case  
studies

SR>0.01mm/h	CC	Bias (GV-PMW)	RMSE
Snow. Surf.	0.40	0.16 mm/h	0.58 mm/h
Other surf.	0.44	0.42 mm/h	0.63 mm/h

## Concluding remarks on validation/intercomparison experiment

- Intercomparison/validation between MW (active and passive) snowfall products is challenging, due to inconsistencies (i.e., “surface snowfall” definition) and scarcity of high-quality GV datasets;
  - **Extend validation experiment to other regions (Finland IKA ground-based radar dataset)**
  - **Compare statistics of NASA, NOAA, CNR-ISAC GPM-era products vs. MRMS and IKA datasets**
- SLALOM approach seems very promising (right pattern) but it reproduces main features of CloudSat/GMI coincidence dataset
  - Tuned for higher latitudes, underestimation of higher snowfall rates
  - Extend validation to the one-year MRMS dataset
- GPROF shows underestimation with respect to MRMS (less over snow covered surface MRMS-based), and lower correlation than SLALOM; good agreement with CPR for US/Canada frontal snowfall systems;
- IWP polarimetric ground-radar estimates: good agreement with SLALOM SWP (but underestimation for higher snowfall intensity)

# Global ATMS CPR coincidence dataset

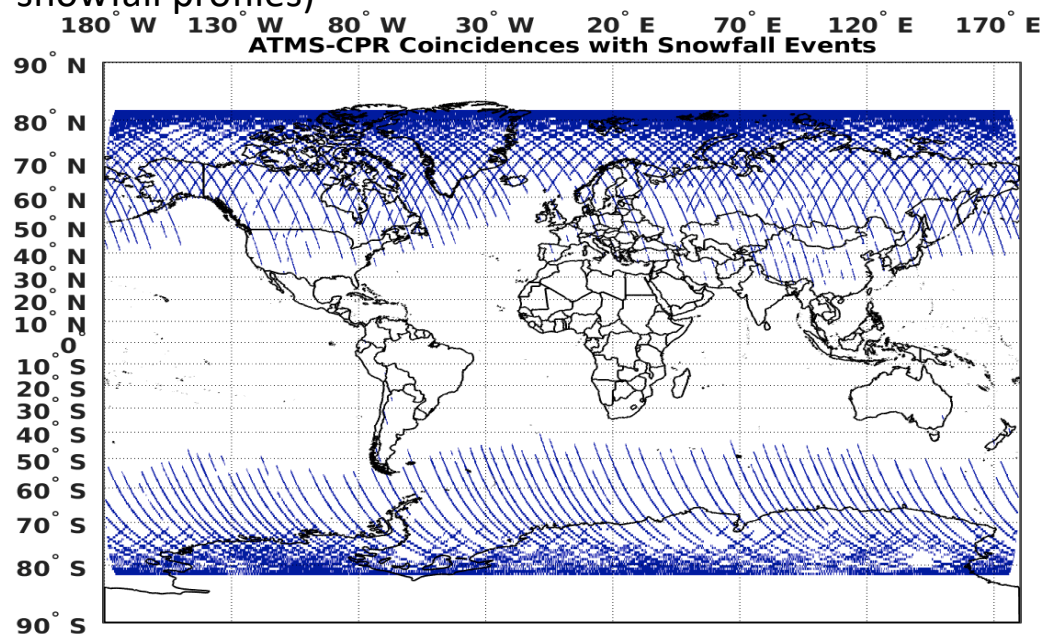
## Why cross-track scanning ATMS?

- 9 channels from 23 to 190 GHz
- On board current and future U.S. **operational polar satellites**
- Future launch of EPS-SG MicroWave Sounder (MWS) (similar to ATMS)

## Main products in the dataset

- ATMS L1c TBs
- CloudSat V05 products (SWP available for SSR=0 mm/h)
- ECMWF-AUX and ERA-5 Ancillary environmental variables
- Supercooled droplet occurrence (CloudSat/Calipso ICARE DARDAR product)
- MODIS products (cloud top height)

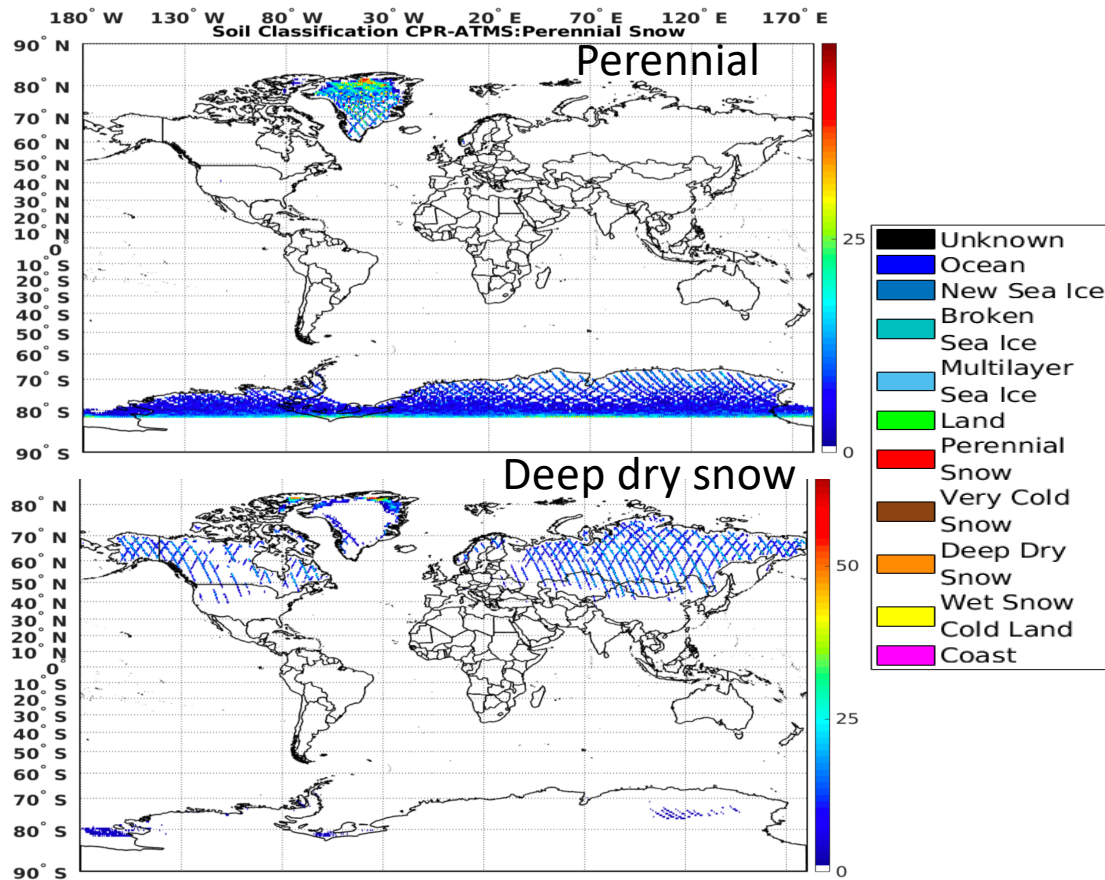
- Over 4.5 M elements from 2015/01/01 to 2016/08/31
- **750K snowing profiles (16%)**
  - 105K with supercooled droplets at cloud top
  - 435K w/o supercooled droplets at cloud top (could be embedded)
  - 211K no information about supercooled droplets (28% of snowfall profiles)



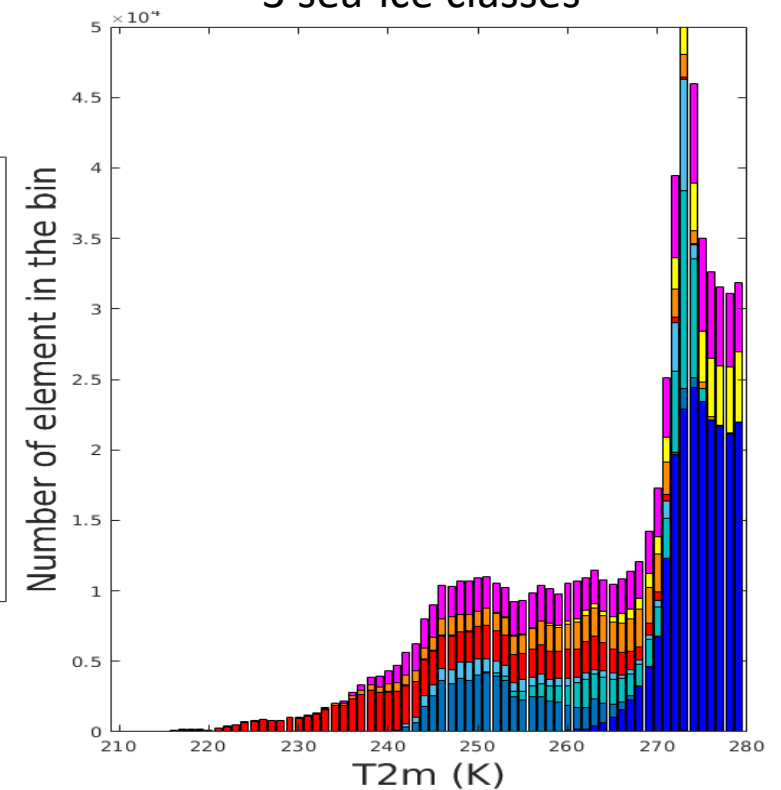


# CNR-ISAC ATMS-based surface classification

Based on 23 GHz and 31 GHz channels and ECMWF-AUX surface temperature



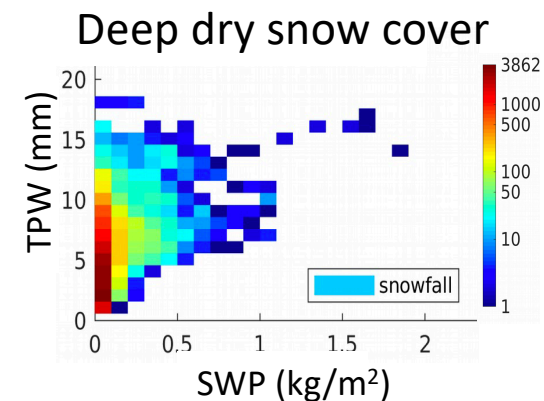
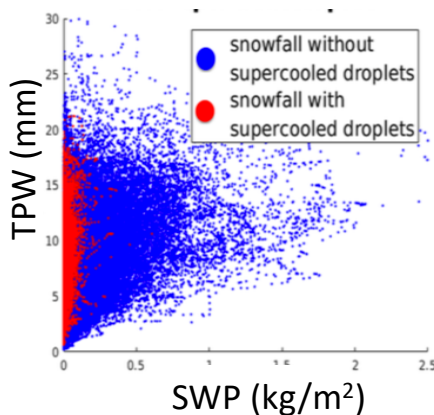
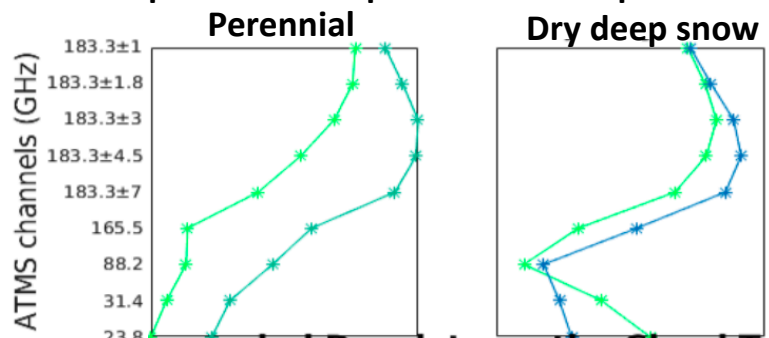
4 snow-cover classes  
3 sea-ice classes



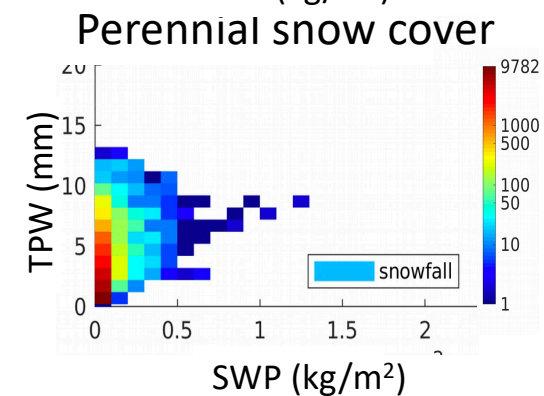
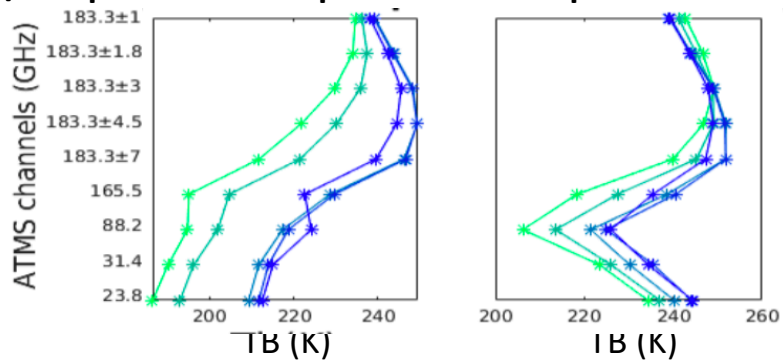


# Global analysis: TB dependance on SWP

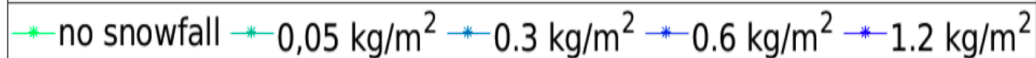
With Supercooled droplets at cloud top



w/o Supercooled Droplets at cloud top

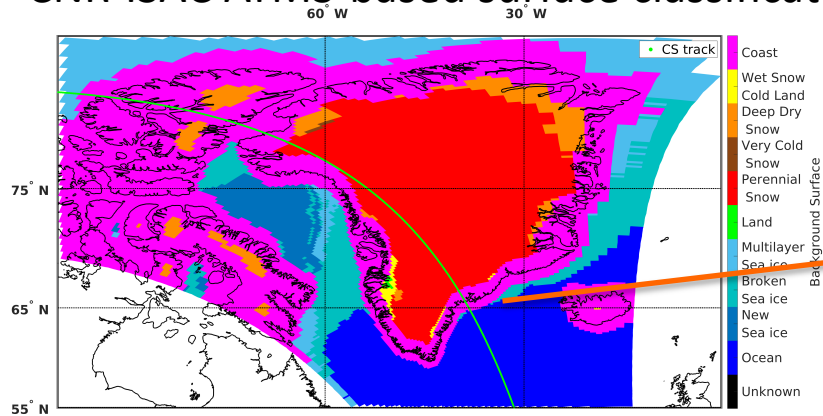


Snow Water Path

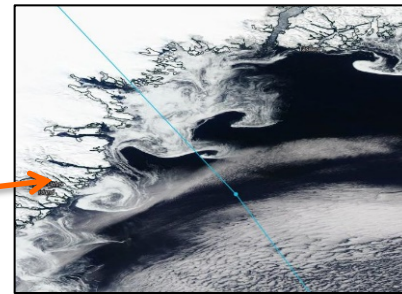


# Greenland Case study 24 April 2016

CNR-ISAC ATMS-based surface classification

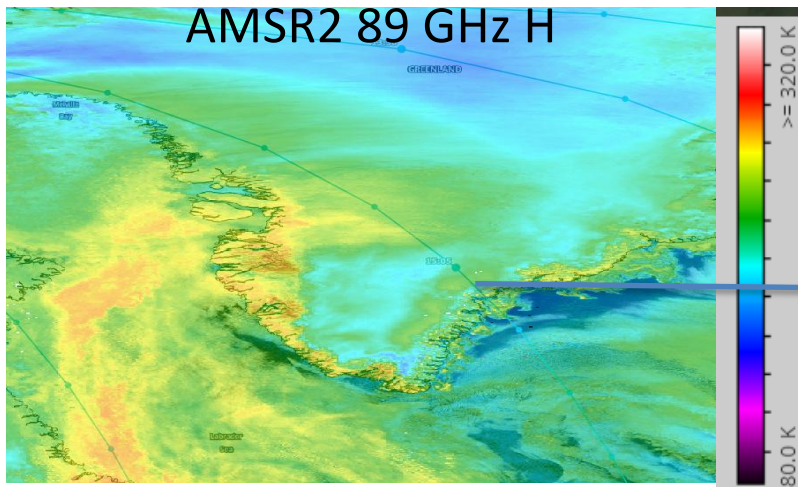


MODIS VIS RGB

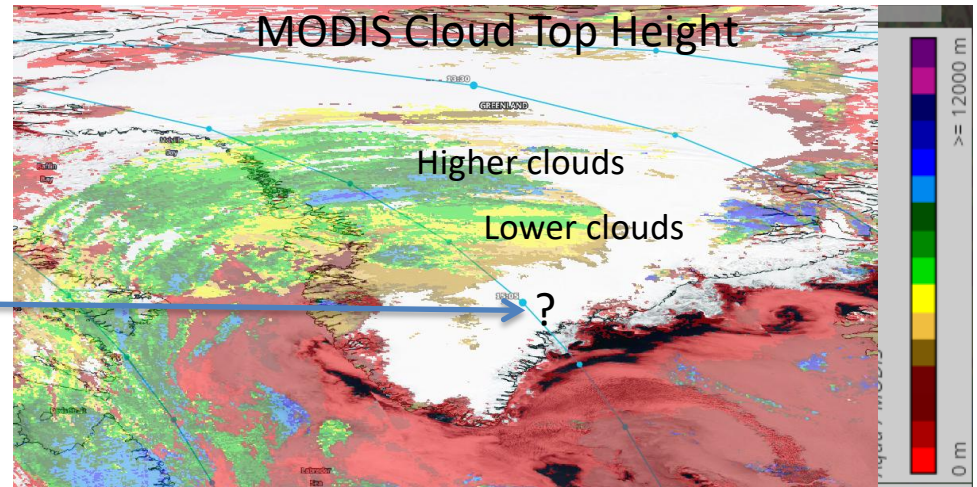


Coast line characterized by very complex features

AMSR2 89 GHz H

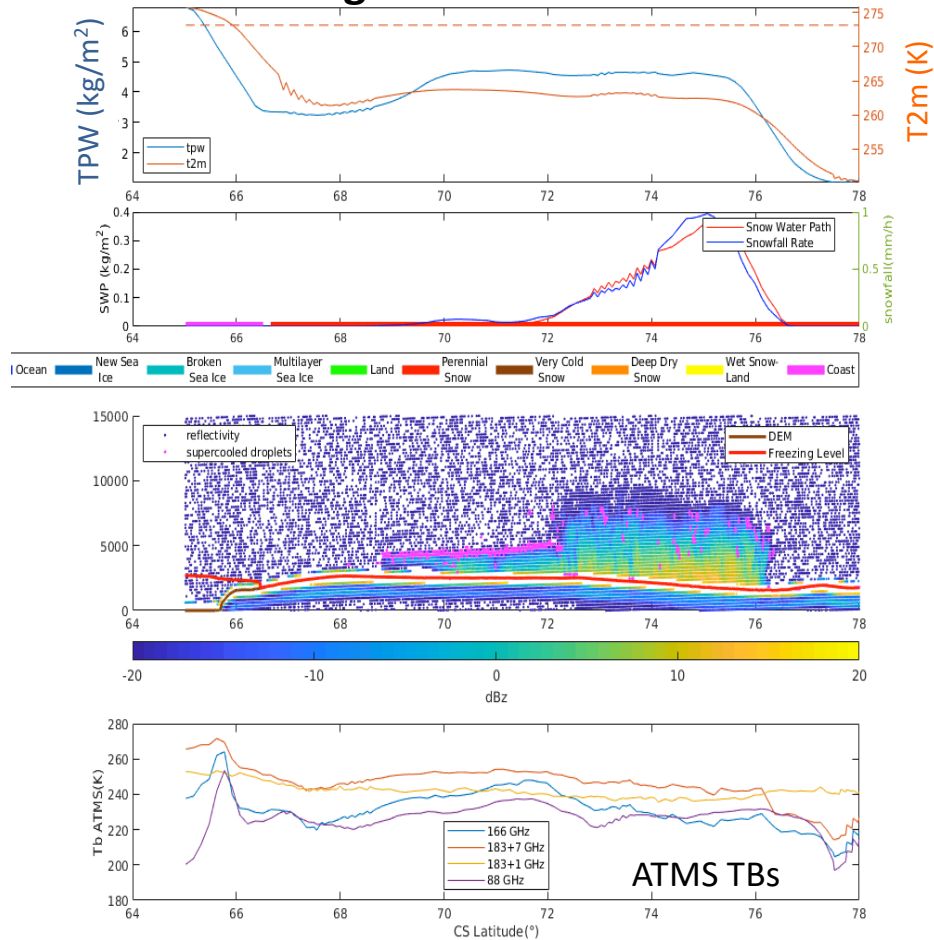


MODIS Cloud Top Height

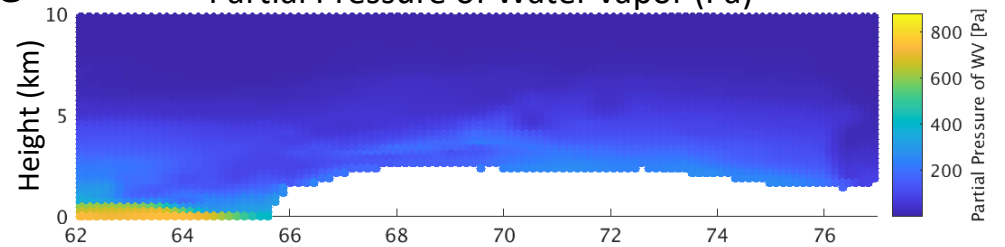


# Greenland Case study 24 April 2016

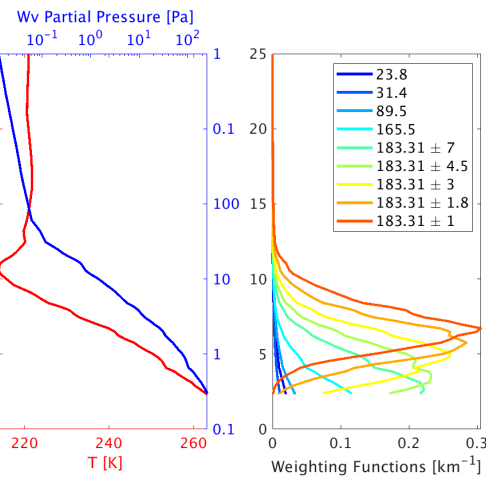
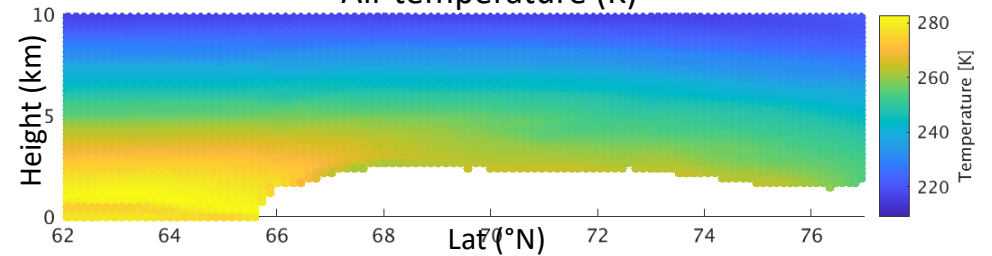
## Along the CloudSat track



## ECMWF AUX Partial Pressure of Water vapor (Pa)



## Air temperature (K)

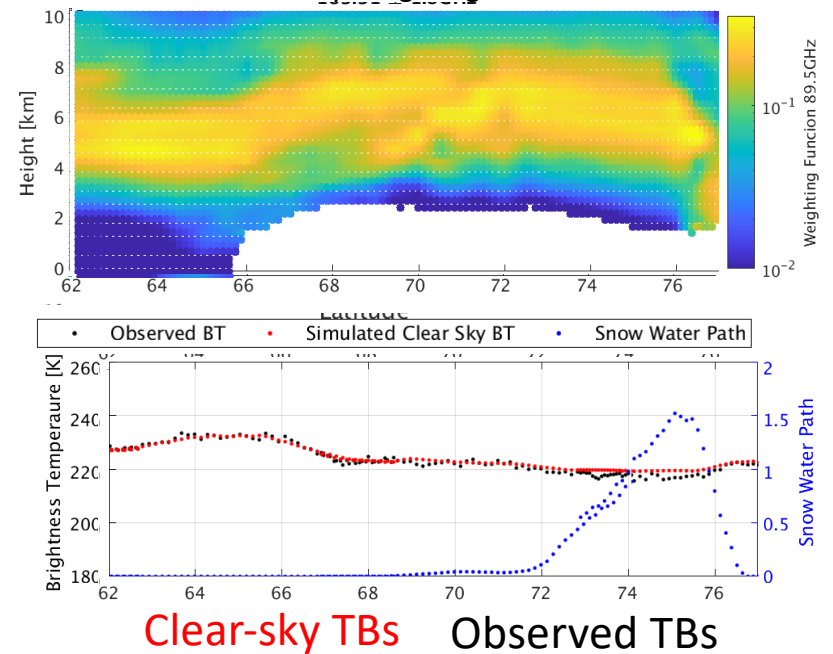
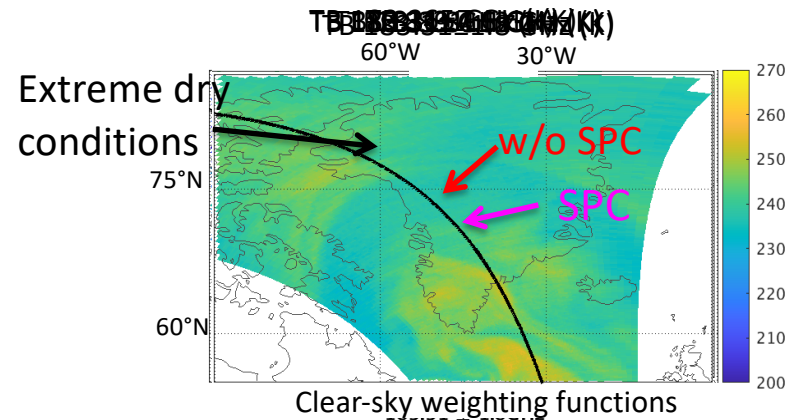
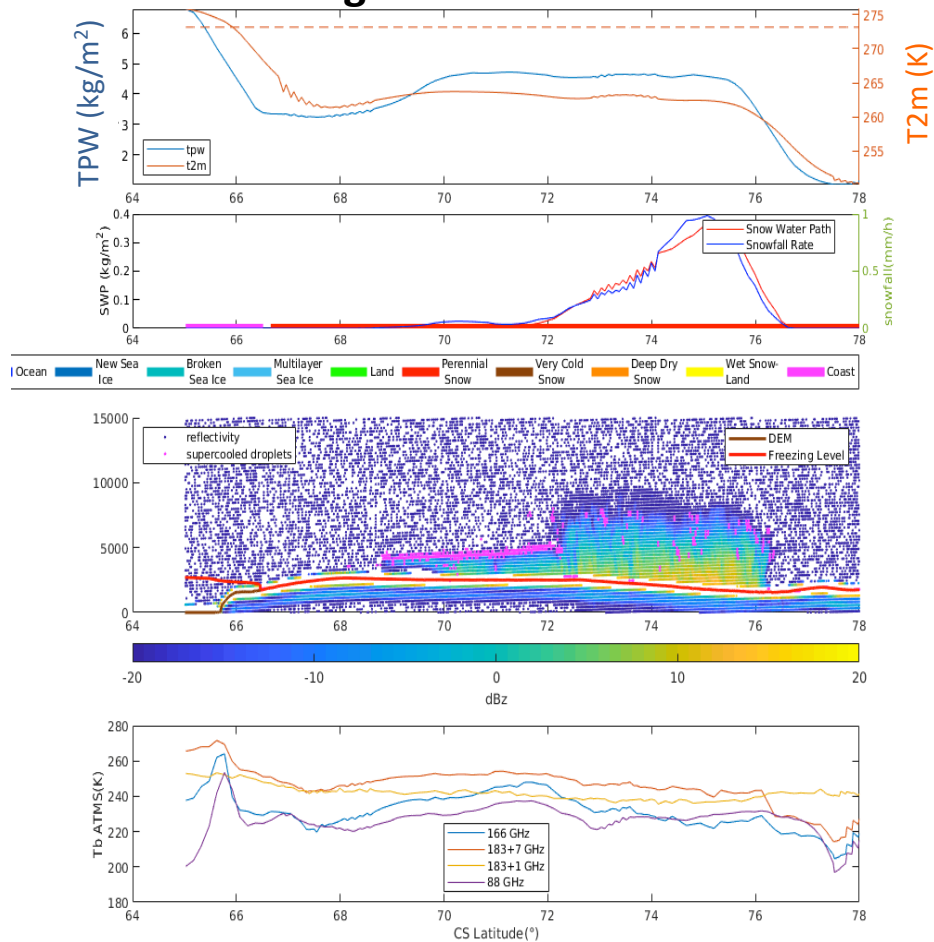


ATMS channels  
clear-sky weighting  
functions  
for mean T and WV  
profile over the  
Greenland plateau

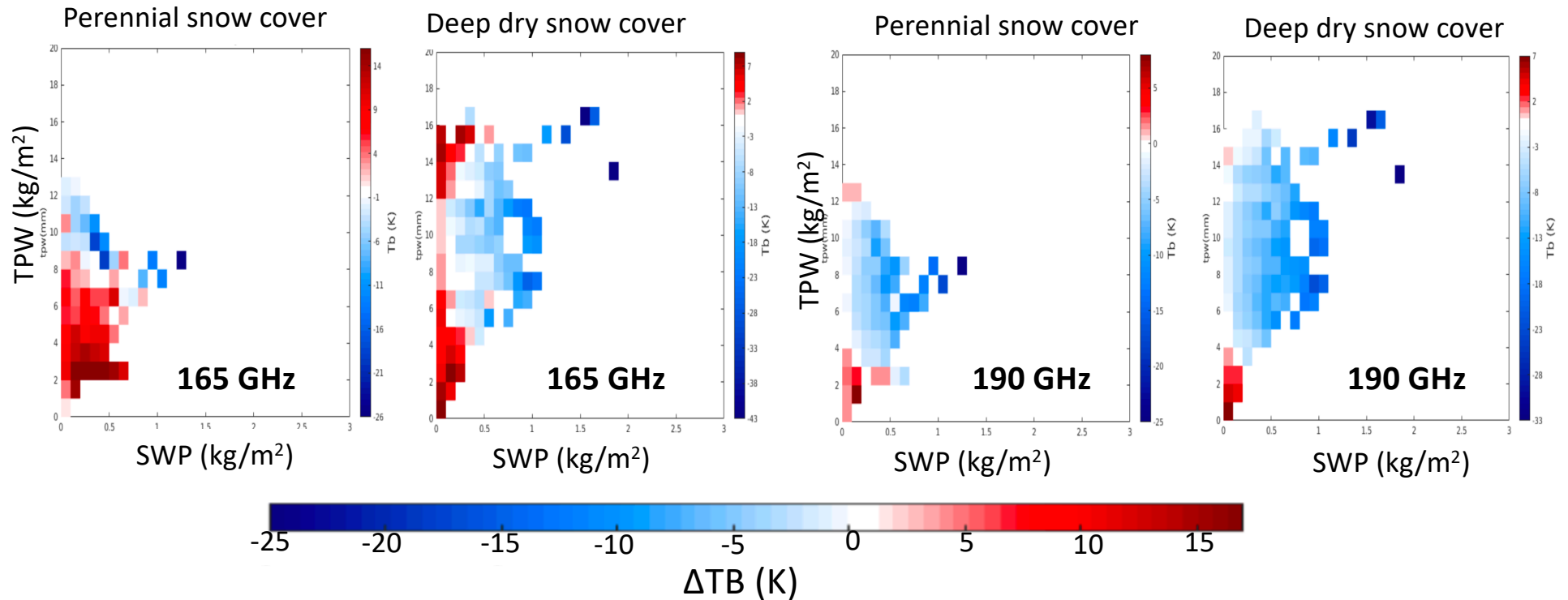


# Greenland Case study 24 April 2016

## Along the CloudSat track



# Global analysis: TB dependence on SWP and TPW



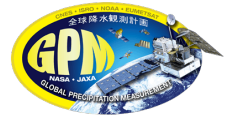
Mean TB difference in TWP/T2m/SWP bins with respect to “clear sky conditions” (SWP=0 kg/m<sup>2</sup>), for each surface type in CloudSat/ATMS dataset

## **Concluding remarks**

### **CloudSat-based ATMS snowfall signal analysis**

- WV and supercooled droplets impact on (weak) snowfall related signal at high latitudes strongly depends on frozen surface conditions
- Knowledge of clear-sky signal at time of the overpass can be very useful for snowfall detection, especially in extreme environments:
  - Characterization of the background surface at the time of the overpass;
  - Good representation of T and WV conditions
- Presence of supercooled droplets need to be carefully accounted for in the algorithm retrieval process (through observational datasets combined with RT simulations)

# Acknowledgements



This study is conducted within EUMETSAT HSAF and ESA RainCast Projects and within the scientific collaboration project between HSAF and PMM Research Program

## RAINCAST study

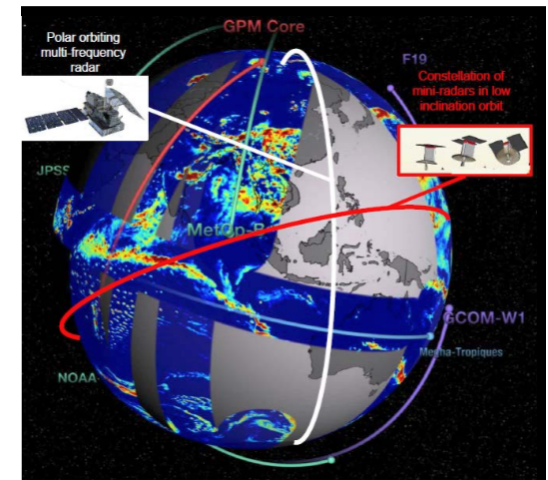
(in response to ESA ITT TT 1-9324/18/NL/NA)

The study aims at identifying and consolidating the science requirements for a **European precipitation satellite mission** that could complement the existing space-based precipitation observing system

(fits the purposes of Earth Observation Science for Society <https://eo4society.esa.int>)

### The snowfall challenge in RAINCAST:

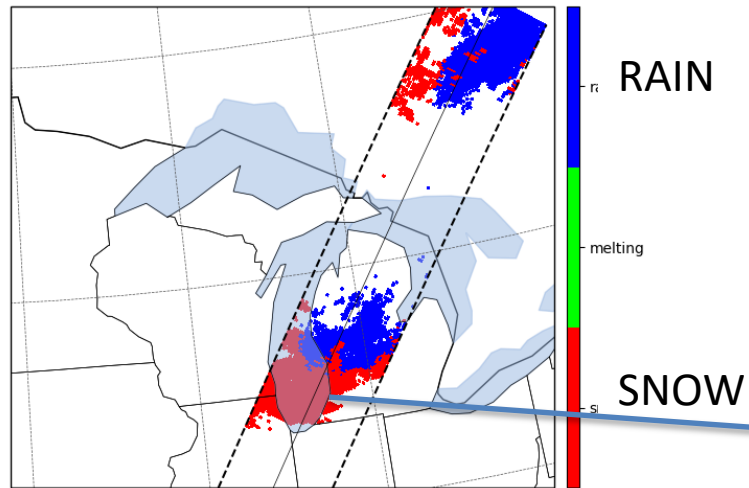
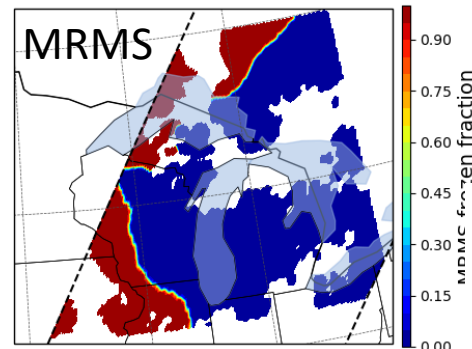
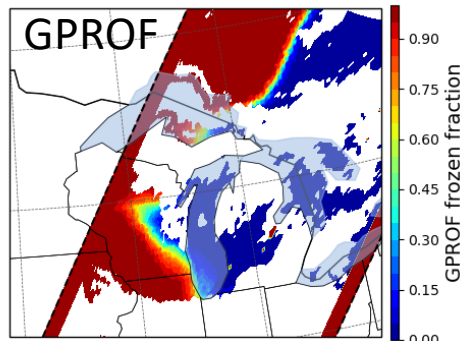
1. To assess snowfall observational capabilities of the most advanced currently available space-borne MW sensors through the exploitation of satellite-based and ground-based observational datasets (*gap analysis*)
2. To provide quantitative criteria and guidelines in terms of passive and active MW capability for the design of a future satellite mission for **snowfall global monitoring** (*gap filling*).





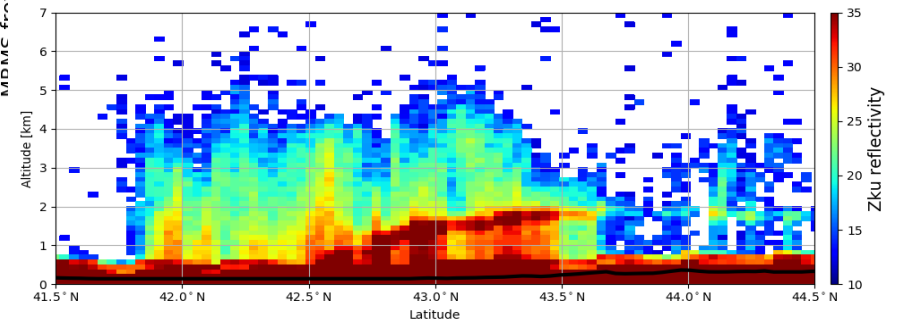
Extra slides

## What about phase?

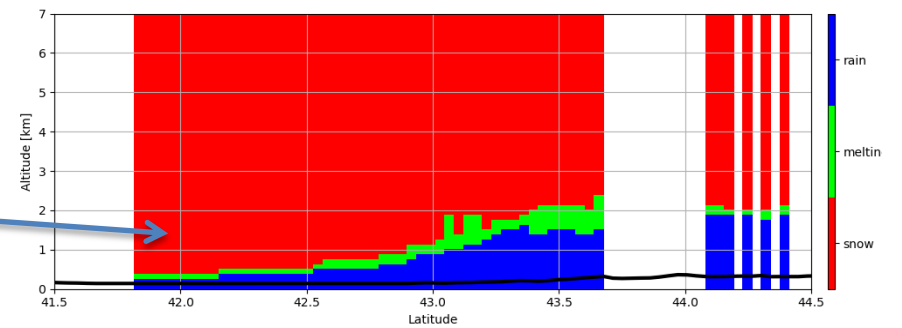


DPR V5 phase classification product  
at NSB level (first ground clutter-free level)

DPR Ku-band  $Z_m$



DPR V5 phase classification



The black line denotes ground elevation

## Case study Comparisons

- MRMS 1 km vs. GMI-GPROF
- MRMS 1km has been averaged on 15 x 15 km FOV of GMI before performing the comparison.
  - Phase information has been averaged
  - Frozen Mask =100 for Snow and =0 otherwise.
  - Then the MRMS frozen fraction (%) on the GMI 15 km-FOVs is obtained averaging the native 1km-MRMS frozen mask onto GMI 15 km-FOVs.
- Time and space colocation has been applied.

## GMI vs. MRMS one year 2014-2015 Comparisons

- MRMS 15 km vs. GMI
- MRMS 15km are already averaged on 15 x 15 km FOV of GMI.
  - Phase information was already average as well and provided as a frozen fraction (%) with values between 0 (fully liquid) and 100 (fully frozen).
  - Time and space colocation was already applied.

# MRMS datasets

- **MRMS**

- MRMS is a US and Canadian effort to provide a Cartesian gridded level II and III radar products at 1 x 1 km horizontal resolution, 2 min time sampling, combining USA and Canadian radar networks.

1. **Case studies**

13 selected from GMI/CPR (and ATMS) coincidence dataset over US/Canada. MRMS 0.01°x0.01° resolution at 2 min time step with the indication of phase:

- Radar quality index
- Hydrometeor phase mask
- Precipitation rate
- hourly Gauge / Radar ratio (for liquid precipitation only)

## MRMS coverage and quality index

